# YIP: Generic Environment Models (GEMs) for Agile Marine Autonomy

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# **LONG-TERM GOALS**

This project builds a roadmap to achieve agile marine autonomy that endows unmanned marine systems with ability to take fast responses to environmental changes. Agile marine autonomy may help unmanned systems to out maneuver opponents in future naval battles.

#### **OBJECTIVES**

The proposal will overcome the demand for significant amount of computing resources and complex software packages from existing ocean modeling methods. The technical objectives include the following:

- 1. Establish the methodology of constructing generic environment models (GEMs). A GEM does not rely on a specific region or a specific ocean process. It can have higher resolution in both space and time and can be computed much faster than classical ocean models. In combination with existing ocean models, GEMs enable navigation of mobile agents in the marine environment in real time.
- 2. Develop control and navigation algorithms that benefit from the GEMs. GEM provides fast information to unmanned systems whose motion also affects the quality of GEMs. Through a new theory called Controlled Lagrangian Particle Tracking (CLPT), we develop methods to refine control and navigation algorithms due to GEMs.
- 3. Provide multi-disciplinary training to graduate and undergraduate students who will be the future task-force in marine technology.

GEMs for agile marine autonomy reflect a tight integration of research in robotics/control with research in physical oceanography. On one hand, it may significantly extend the capabilities of existing ocean modeling theory to better serve operations of autonomous agents. On the other hand, it may results in novel map-making methods and navigation methods in four-dimensional marine processes that have not been achieved in the field of robotics. Therefore, the proposed research program may create new opportunities to advance both oceanography and robotics/control engineering research.

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### **APPROACH**

The work is currently performed by PI Fumin Zhang and four graduate students in Georgia Tech: Paul Varnell (started Fall 2010), Chuanfeng Wang (started Fall 2010), Dongsik Chang (started Fall 2009), Klementyna Szwaykowska (started Fall 2007). In addition, three undergraduate students are hired on an hourly base to develop experimental marine robots. The PI is leading the team. Paul Varnell focuses on the dissipativity based design for human operated marine sesing networks. Chuanfeng Wang focuses on the environmental modeling and map-making algorithms with implemenation on the YSI Ecomapper. Dongsik Chang focuses on the automation middleware systems and control of underwater gliders. Klementyna Szwaykowska focuses on the CLPT theory and path planning alogrithms using the Generic Environment Models. The approach and methodologies employed, corresponding to the above objectives, are as follows:

- 1. A novel methodology to construct the generic environment models (GEMs) is being developed. The structure of the GEM are determined through existing ocean models by parsing output data from the ocean models. A set of model updating algorithms is being developed to assimilate data collected by unmanned marine systems. The time required to compute different GEMs will be analyzed and compared.
- 2. The fundamental theoretical principles governing the interactions between the GEMs and unmanned systems are being discovered. These principles are formulated as the theory of controlled Lagrangian particle tracking (CLPT). In-depth analysis are being performed about the discrepancy between the trajectories of unmanned marine systems in the ocean and in predictions generated by using the GEMs.
- 3. Strategies to achieve agile marine autonomy with GEMs are being developed. PI's work in automation middleware have been applied to implement GEMs. Method of controller refinement are being developed to extend PI's work in bio-inspired autonomy to incorporate GEMs. Research will be performed to integrate GEMs with refined control and navigation algorithms to enable fast response to the environment.
- 4. Low cost and lab scale experiments have been carried out to validate and inspire the theoretical work. Methods and algorithms will be first tested on ground mobile robots in a lab. YSI Ecomapper and student developed marine robots will be used to perform experiments in a small lake. PI's existing collaborations with the industry and Naval Research Labs will be leveraged to transfer the research findings from academia to applications.
- 5. Education and outreach activities will be performed at the graduate, undergraduate, and K-12 levels. A multidisciplinary training program will be established at the graduate and undergraduate level. Agile marine autonomy have been taught in a robotics course, and a new textbook is being developed.

## WORK COMPLETED

We have deployed two underwater gliders for ocean sampling in Long Bay, SC during winter 2011 and spring 2012, where the GEM is built to represent ocean current between the shore and the gulfstream for glider navigation. The CLPT theory has been validated. During the glider experiments, we have observed new behaviors that have inspired us to advance CLPT.

Two Slocum underwater gliders have been deployed in Long Bay, SC for an NSF project: "Mechanisms of nutrient input at the shelf margin supporting persistent winter phytoplankton blooms downstream of the Charleston Bump." PI's team have controlled the motion of the two gliders to navigate near the edge of the Gulfstream, where strong current exceeding glider horizontal speed is often observed. We developed a GEM combining a simple tidal and Gulfstream current model based on M2 tide and sinusoidal meandering motion of Gulf Stream as shown in Figure 1. The GEM uses the ADCIRC model to initialize. Using the Glider Coordinated Control Systems (GCCS) developed by PI's team, we implemented a control algorithm to maintain a glider's position near the edge of Gulfstream. Starting from different positions, the trajectories for station holding are illustrated in Figure 3. It can be observed that the glider is able to escape from a strong northward Gulfstream current and come back to its desired position at the cross hair near the bottom of the figure.

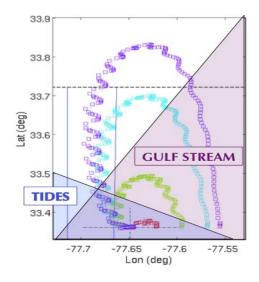


Figure 1. A station-keeping algorithm produces paths of simulated gliders in Long Bay, SC. A GEM is developed to combine tides and the gulfstream.

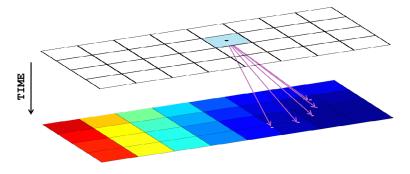


Figure 2. An illustration of dynamic programming for glider path planning. The arrows represent possible motions of the glider over one time step, given different available control actions (heading angles); the glider's final position at the next time step depends on both the heading angle and the ambient flow. The value function at the current state (blue rectangle in the top layer) is given by the minimum over all possible heading. angles of the sum of the current distance from the goal and the value function at the glider's final position.

A dynamic programming approach has been implemented to generate optimal paths for one of the underwater gliders to maintain minimal distance from a set goal point under the influence of flow. This approach uses a cost function that integrates the glider's distance from the goal over a finite time horizon. The domain of operation is discretized in both space and time, and the cost-to-go and associated optimal control actions are computed at each point in the discretized domain, starting at the final time (see Figure 2). The glider's position is then integrated forward using a simple particle model for the glider dynamics. At each time step in the integration, the glider's control action (e.g. the choice of heading angle) is taken to be a bilinear interpolation of the optimal control actions at the nearest states in the discretized domain. The glider's total velocity is taken as a sum of the glider's throughwater velocity and the predicted flow velocity, which is obtained from the GEM used. This gives a near-optimal trajectory that can be converted to a waypoint list to be passed to the glider. Figure 3 shows a planned path in a simulated flow field.

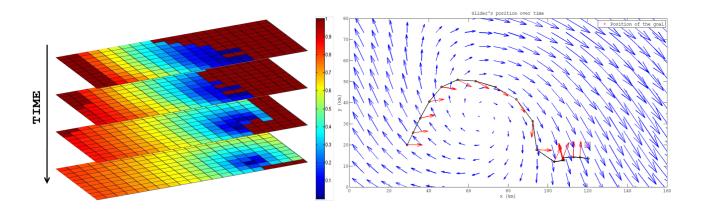


Figure 3. Dynamic programming-based path planning over a sample domain with a static flow field. The value function for all x,y positions is shown at selected time slices (left). The red on the far left and right sides of the domain marks the infeasible positions from which the glider will be carried out of the domain by the flow within the planning time horizon regardless of the control action taken (the cost at these positions is maximized). Given the value function, a path to the goal can be computed from an arbitrary starting position (if it is feasible). A sample path is shown in the figure on the right. The blue arrows show the flow velocity over the domain. The red arrows show glider headings along the path. The goal position is marked by an asterisk.

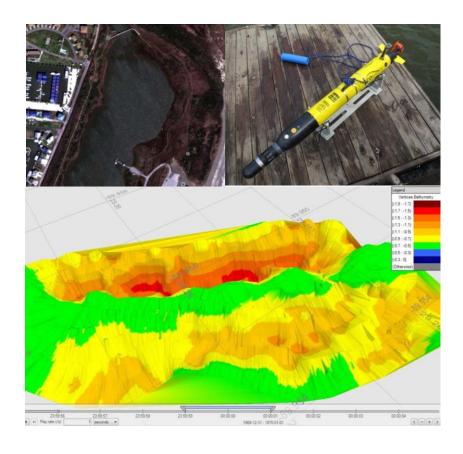


Figure 4. Bathymetry survey using an YSI Ecomapper for a retention pond in Grand Isle State Park, LA

The strength of GEM goes beyond ocean flow modeling. We have deployed a YSI Ecomapper for bathymetry survey at a location near the Gulf of Mexico, where the GEM is built to represent the bathymetry data. The EcoMapper (Figure 4, upper right) is an autonomous underwater vehicle purchased from YSI Inc. If operating in the autonomous mode, the EcoMapper follows a predefined course, either on surface or below surface and records all sensor measurements into log files. As part of an NSF funded project "Autonomous Control and Sensing Algorithms for Surveying the Impacts of Oil Spills on Coastal Environments" led by the PI, the EcoMapper was deployed to survey the tidal lagoon located at the Grand Isle State Park (Figure 4, upper left) in Louisiana where oil pollutions have been spotted in 2010. Five autonomous missions between surface and 0.5 meters below surface were executed. By interpolating the DVL data, we obtained a bathymetry map for this pond (Figure 4, bottom). The salinity of the lagoon varies between 13ppt and 17ppt under different weather condition.

A sister version of the Ecomapper, the IVER, has been adopted by the Navy. To enable further developments of the autonomy capability of this device, we have developed a detailed hydrodynamic model for the YSI Ecomapper using computational fluid software.

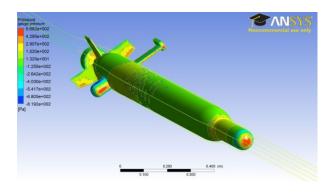


Figure 5. Hydrodynamic modeling of the YSI Ecomapper.

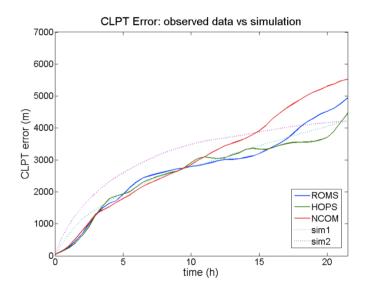


Figure 6. CLPT error growth over time. This data was collected during the 2006 ASAP experiment in Monterey Bay, CA. The simulated glider positions were computed using 3 ocean models (Regional Ocean Modeling System (ROMS), Harvard Ocean Prediction System (HOPS), and Navy Coastal Ocean Model (NCOM)). True glider positions were obtained from GPS fixes from the gliders over the course of the experiment. The plots show average error for all gliders and all days of the experiment for which data is available. The dotted lines show the expected value of the CLTP error over time, based on our Langevin model of CLPT error growth. Agreement between the model and the data suggests that the Langevin equation-based approach can be used to evaluate the accuracy of GCCS position simulation in future glider deployments.

# **RESULTS**

We use controlled Lagrangian particle tracking (CLPT) to evaluate the accuracy of the simulated glider position. Errors in glider position simulation are due to limited resolution of ocean models, missing physics in the models, and sparseness of available ocean measurements used to drive the model. Using a modified Langevin equation to model the growth of the expected glider position error (termed CLPT error), we have shown that the magnitude of the expected error in simulated position grows exponentially until reaching a lower bound equal to twice the grid size of the ocean model used (see

Figure 6). The error growth then slows to a polynomial function of time. Similar error growth behaviors have also been observed in the Long Bay deployment as shown in Figure 7. Based on this new evidence, we are able to conclude that the theory of CLPT may be trustworthy tool to predict navigation performance for underwater gliders under the guidance of ocean circulation models.

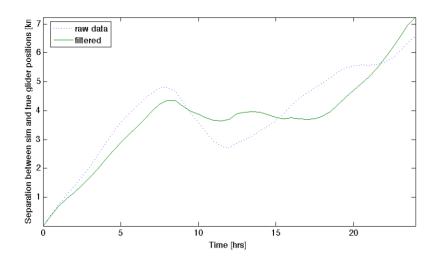


Figure 7. CLPT Error analysis for glider navigation performance during the 2012 Long Bay Experiments.

#### IMPACT/APPLICATIONS

Technology advancement has been a driving force for changes in Naval battle strategies. The Pearl Harbor attack marked the diminishing of surface-surface warfares between gunships and the beginning of the era of Naval airforce. The Falklands Naval War between Agentina and the UK demonstrated the devastating power of guided air-surface missiles. The Navy and other branches of the armed forces are now in transition to a new era of unmanned systems. The next Naval battle may prove that an agile marine autonomy is key to victory. The GEMs proposed in this proposal are stepping stones for unmanned marine systems to react promptly to a changing operational environment so that they can gain an upper hand by out-maneuvering their opponents. The generic nature of the methods makes GEMs scalable and portable. Furthermore, as the intelligence of unmanned systems grows, GEMs may be shifted from the network level to the platform level to achieve a new level of agile autonomy.

## RELATED PROJECTS

Generic environment modeling and agile autonomy are closed connected with other ONR and NSF projects the PI is participating.

1. ONR: Automation Middleware and Algorithms for Robotic Underwater Sensor Networks. PI has just finished this three-year project where we have created the theory of controlled Lagrangian Particle Tracking (CLPT) and extended the functionality of the Glider Coordinated Control System (GCCS). Both the CLPT and GCCS will be further developed in the current project.

- 2. ONR: Bio-Inspired Autonomous Control for Optimal Exploration and Exploitation in Marine Environments (BioEx). PI participated in this project. The project goal is to institute an innovative multidisciplinary investigation of autonomous collective foraging in a complex environment that explicitly integrates models and insights from biology with models and provable strategies from control theory. The work on Agile autonomy is complementary to the bio-inspired engineering solutions on autonomy.
- 3. NSF: Mechanisms of Nutrient Input at the Shelf Margin Supporting Persistent Winter Phytoplankton Blooms Downstream of the Charleston Bump. We will deploy underwater gliders in Long Bay, SC to study mechanisms of nutrient input at the shelf margin supporting persistent winter phytoplankton blooms downstream of the Charleston Bump. GEM and GCCS has been applied to this project.

## **PUBLICATIONS**

## Journal articles:

- W. Wu and F. Zhang, "Cooperative Exploration of Level Surfaces of Three Dimensional Scalar Fields," *Automatica, the IFAC Journal* 47(9): 2044-2051, 2011. [published, refereed]
- M. Malisoff, F. Mazenc, and F. Zhang, "Stability and Robustness Analysis for Curve Tracking Control using Input-to-State Stability," *IEEE Transactions on Automatic Control*, 57(5):1320-1326, 2012. [published, refereed]
- H. Yang and F. Zhang, "Robust Control of Formation Dynamics for Autonomous Underwater Vehicles in Horizontal Plane," *ASME Journal of Dynamic Systems, Measurement and Control*, 134(3): 031009 (7 pages), 2012. [published, refereed]
- W. Wu and F. Zhang, "Robust Cooperative Exploration with a Switching Strategy," *IEEE Transactions on Robotics*, 28(4):828-839, 2012. [published, refereed]
- K. Szwaykowska and F. Zhang, "Trend and Bounds for Error Growth in Controlled Lagrangian Particle Tracking," *IEEE Journal of Oceanic Engineering*, 2012. [accepted, refereed]

## **Refereed Conference Proceedings:**

- K. Szwaykowska and F. Zhang, "A Lower Bound for Controlled Lagrangian Particle Tracking Error," in *Proc.49th IEEE Conference on Decision and Control (CDC 2010)*, 4353-4358, 2010. [published, refereed]
- K. Szwaykowska and F. Zhang, "A Lower Bound on Navigation Error for Marine Robots Guided by Ocean Circulation Models," in *Proc. 2011 IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS 2011)*, 3583-3588, 2011. [published, refereed]
- W. Wu and F. Zhang, "Explorability of Noisy Scalar Fields," in *Proc. 50th IEEE International Conference on Decision and Control (CDC 2011)*, 6439-6444, 2011. [published, refereed]

- M. Malisoff and F. Zhang, "Adaptive Controllers and Robustness Analysis for Curve Tracking with Unknown Control Gains," in *Proc. 2012 American Control Conference (ACC 2012)*, 344-349, 2012. [published, refereed]
- W. Wu, I. D. Couzin, and F. Zhang, "Bio-inspired Source Seeking with no Explicit Gradient Estimation" in *Proc. 3rd IFAC Workshop on Distributed Estimation and Control in Networked Systems (NecSys'12)*, 240-245, 2012. [published, refereed]
- X. Liang, W. Wu, D. Chang, F. Zhang, "Real-time Modelling of Tidal Current for Navigating Underwater Glider Sensing Networks," *Procedia Computer Science*, 10:1121-1126, 2012. [published, refereed]

## HONORS/AWARDS/PRIZES

Recipient: Fumin Zhang

Institution: Georgia Institute of Technology

Award: 2010 ONR YIP Award Sponsor: Office of Naval Research

Recipient: Fumin Zhang

Institution: Georgia Institute of Technology

Award: 2010 Lockheed Inspirational Young Faculty Award

Sponsor: Lockheed Martin Co.

Recipient: Fumin Zhang

Institution: Georgia Institute of Technology

Award: 2011 Roger P. Webb Outstanding Junior Faculty Award

Sponsor: School of Electrical and Computer Engineering, Georgia Tech

Recipient: Fumin Zhang

Institution: Georgia Institute of Technology

Award: 2011 Distinguished Lecturer on Cyber-Systems and Control

Sponsor: Zhejiang University, China

Recipient: Georgia Tech Savannah Robotics (Supervised by Fumin Zhang)

Institution: Georgia Institute of Technology

Award: 2011 Martin Klein MATE Mariner Award

Sponsor: Marine Advanced Technology Education (MATE) Center

Recipient: Fumin Zhang

Institution: Georgia Institute of Technology

Award: The 2012 SOE Industry Excellence Award

Sponsor: Savannah Ocean Exchange